

# Modeling of Submillimeter Passive Remote Sensing of Cirrus Clouds <sup>1</sup>

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January 24, 1997

<sup>1</sup>Submitted to Journal of Applied Meteorology. Copyright may be transferred to AMS without further notice.

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## Abstract

The scattering properties of cirrus clouds at submillimeter-wave frequencies are analyzed and characterized in this paper. This study lays a theoretical foundation for using radiometric measurements to investigate and monitor cirrus properties from high flying aircraft or satellite. The significance of this capability is that it would provide data on the global distribution of cloud ice mass that is currently required to validate climate models. At present these needs remain unmet by existing and planned observational systems.

In this study the brightness temperature depression ( $\Delta T_b$ ) of upwelling radiation due to cirrus clouds is simulated at 150, 220, 340, 500, 630, and 880 GHz. The effects of a range of size distributions, eight ice particle shapes, and different atmospheric profiles are modeled. The atmospheric transmission is high enough in the submm windows to allow upper tropospheric sensing from space, but absorption by water vapor reduces the sensitivity to lower cirrus clouds in a simply predictable manner. It is shown that frequencies above 500 GHz have adequate sensitivity to measure cirrus cloud properties. For these higher frequencies the  $\Delta T_b$  is closely proportional to IWP for median mass equivalent sphere diameters ( $D_{me}$ ) above  $125 \mu\text{m}$ . The differing sensitivity with frequency allows two channels to determine particle size.

A two-channel Bayesian algorithm is developed to assess retrieval accuracy with a Monte Carlo error analysis procedure. Particle shape, size distribution width, and receiver noise are considered as error sources. The rms errors for nadir view with 630/880 GHz are less than 40% for  $\text{IWP} > 5 \text{ g/m}^2$  and  $D_{me} > 100 \mu\text{m}$ , while using an oblique viewing angle of  $73^\circ$  results in the same accuracy down to an IWP of  $1 \text{ g/m}^2$  (visible optical depth less than 0.1). The two-channel algorithm and error analysis method are used to show how submm radiometer and mm radar measurements may be combined.

## 1. Introduction

The high altitudes and cold temperatures of cirrus clouds contribute to their distinct radiative properties as well as their resistance to adequate characterization. The cold brightness temperatures of cirrus clouds compared to clear skies means they provide a large infrared “greenhouse” effect in addition to reflecting solar flux. Numerical studies have shown that the optical thickness of cirrus clouds determine whether they warm or cool the atmosphere and surface (Stephens and Webster 1981; Liou 1986). In addition, cirrus clouds cover a substantial fraction of the Earth. The International Satellite Cloud Climatology Project (ISCCP, Rossow and Schiffer 1991) results for 1990 show that 18% of globe on average is covered by high cloud not categorized as deep convection. The actual cirrus cloud coverage is larger as ISCCP does not detect optically thin cirrus.

Because of their prevalence and radiative significance, it is crucial that cirrus clouds be accurately represented in climate models. GCMs have improved their cloud models by using parameterizations that predict cloud ice mass (e.g., Fowler et al. 1996) as one part of the hydrologic cycle. Along with cirrus cloud fraction and optical properties, it has become more important for cirrus ice mass distribution to be measured accurately for climate model evaluation. Current ice cloud parameterizations are hardly constrained by existing measurements of ice mass with error bars perhaps as large as a factor of 3.

The high altitude of cirrus clouds makes in situ measurements of microphysical properties difficult, and so they remain poorly known. In addition, the nonspherical shapes of the ice particles has made interpretation of remotely sensed observations subject to large error. For example, solar reflectance techniques for cirrus must convert reflectance to optical depth using phase functions that are highly sensitive to particle shape. Then additional errors are introduced when optical depth is converted to ice water path with inferred effective particle sizes. Furthermore, there are substantial errors from vertical and horizontal

inhomogeneities in clouds that are not optically thin. It is thus desirable to develop remote sensing techniques that will improve the measurement of cirrus characteristics such as integrated ice mass.

At submillimeter wavelengths ( $> 300$  GHz) the lower atmosphere emits a relatively uniform flux of upwelling radiation (the surface is unimportant because water vapor absorption makes the lower atmosphere opaque). Cirrus ice particles scatter some of this upwelling radiation back down. To an observer above a cirrus cloud, the scattering decreases the brightness temperature from the clear sky value, while to an observer flying just below a cirrus cloud, the effect is to increase the brightness temperature. As the wavelength of microwave radiation decreases to the size of the cirrus particles, the sensitivity to cirrus ice mass increases dramatically. The change in brightness temperature depends on the integrated ice mass (ice water path or IWP) and the characteristic particle size and shape.

Passive microwave, particularly submillimeter-wave (submm), remote sensing has a number of potential advantages that complement existing visible and infrared techniques. Since the wavelength of submm radiation is comparable to the size of ice particles in cirrus clouds, the effect of cirrus on observed brightness temperatures is well correlated to ice mass. This contrasts with visible and infrared methods, which operate in the geometric optics limit where the signal is proportional to the particle area. Microwave radiation interacts with ice particles primarily through scattering so emission and cloud temperature are relatively unimportant. Furthermore, radiative transfer tends to occur in a linear regime where the signal is directly proportional to the microwave optical depth. This reduces the importance of cloud inhomogeneity

With advances in microwave detectors, sensing cirrus clouds with submm radiometers is becoming a practical subject. The NASA ER-2 aircraft-based Millimeter-Wave Imaging Radiometer (MIR) (Racette et al. 1996) has frequencies up to 325 GHz. The Odin satellite

(a joint effort of Sweden, Canada, Finland, and France) is due to be launched in 1998 and will observe both astronomical objects and the Earth's upper atmosphere. Odin will carry a submillimeter spectrometer, capable of scanning the atmosphere, at frequencies centered at 118, 495, 550, 555, and 572 GHz. A prototype submm radiometer designed to measure cloud ice has been built at the Jet Propulsion Laboratory (JPL) and was flown on the NASA DC-8 in the fall of 1996<sup>1</sup>. The JPL radiometer measures two orthogonal linear polarizations at 500 and 630 GHz with matched 3° beamwidths and has scanning capability.

Previous work examining microwave remote sensing of cirrus has been limited. Gasiewski (1992) performed a theoretical study on the use of radiometric measurements from 90 to 410 GHz. Using radiative transfer simulations he investigated the sensitivity of brightness temperatures to water vapor, precipitation, liquid clouds, and ice clouds (modeled with a one-parameter size distribution of spheres). He showed that multiple widely spaced frequencies provided additional degrees of freedom for cloud sensing. Muller et al. (1994) performed a similar theoretical study at Advanced Microwave Sounding Unit (AMSU) frequencies that used a single size distribution of ice spheres.

This study expands on the theoretical work of Evans and Stephens (1995b) by consideration of submm frequencies and characterization of the retrieval error using a preliminary two-channel algorithm. The previous work with frequencies up to 340 GHz found that the sensitivity of microwave radiometry to cirrus IWP increases with frequency and that characteristic particle size is the major factor in relating brightness temperature change to IWP. The differential sensitivity of two widely spaced radiometer frequencies was found to be useful in estimating characteristic particle size. The brightness temperature depression was shown to be nearly independent of cloud temperature and details of the underlying atmo-

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<sup>1</sup>Data from these measurements are currently being analyzed and will be reported at a later date (S. Walter)

sphere. The purpose of this study is to calculate radiative properties for a range of realistic cirrus clouds at six frequencies emphasizing the higher submm frequencies. An algorithm to retrieve cirrus ice water path and particle size is presented, which allows the effects of various error sources (such as receiver noise, particle shape, water vapor absorption, and background variations) on the retrieval accuracy to be investigated.

Modeling methods are covered in section 2. The use of observed ice cloud particle size distributions is described in section 3. The basic radiative transfer modeling results for gamma distributions are presented in section 4. Section 5 describes the retrieval algorithm and error analysis for the submm radiometer algorithm and a combined radar/radiometer technique.

## **2. Modeling Methods**

The modeling results are shown for six frequencies, 150, 220, 340, 500, 630, 880 GHz. These frequencies are located in atmospheric windows and were chosen to coincide with frequencies used by existing sensors or are candidates for future instruments. The MIR has channels at 150 and 220 GHz and three channels spaced around the water vapor line at 325 GHz. The JPL prototype ice cloud radiometer made measurements at 500 and 630 GHz. These two frequencies were originally selected based on the availability of existing receivers and were not optimized for cirrus sensing. The 880 GHz frequency was chosen to be in the center of the highest frequency clear window for upper tropospheric sensing.

The atmospheric transmission from space to 4 altitudes in the atmosphere are shown in Fig. 1. The lowest two frequencies have significant transmission to the surface, while the three highest frequencies have adequate transmission to the upper troposphere and no contribution from the lower troposphere. Of course, the transmission is strongly dependent on the amount of water vapor in the atmosphere.

To simulate brightness temperatures measured by a submm radiometer it is necessary to 1) model single scattering properties of distributions of realistic cirrus ice particle and 2) model polarized radiative transfer in atmospheres containing a range of cirrus cloud properties.

*a. DDA modeling*

The electromagnetic scattering properties of cirrus ice particles is computed here using the discrete dipole approximation (DDA). For a recent review of the method see Draine and Flatau (1994). The DDA approach divides the particle into a number of subunits (dipoles) whose size is small compared to the incident wavelength of radiation. The main computational task of the DDA is to invert the coupled system of dipole interactions for the dipole polarizations, from which the resulting far field scattering properties is derived. DDA is a general technique because it can be applied to any particle shape, although computer limitations have restricted the method to particles that are only slightly larger than the wavelength. The method used here is based on that of Goedecke and O'Brien (1988), and is described in detail in Evans and Stephens (1995a) (except the isotropic lattice dispersion relation (Draine and Goodman 1993) is used in this study for the dipole self-interaction term).

The DDA is used to model the scattering properties for 21 particles sizes from 10 to 1000  $\mu\text{m}$  (1 mm) (maximum particle diameter). In-situ observations of cirrus show that particles larger than 1.0 mm are very rare, though this depends on how the boundary between cirrus and thicker precipitating ice clouds is defined. Particle sizes smaller than 10  $\mu\text{m}$ , even if they exist in most cirrus clouds, have very little effect on either the submm radiation or the ice water content. The DDA dipole size varies with the particle size, but has a minimum size of 8  $\mu\text{m}$  (Table 1). The dipole size criterion  $|m|kd$  ( $k = 2\pi/\lambda$ ,  $\lambda$  is the

wavelength, and  $d$  is the dipole size) for the largest dipole size and highest frequency does not exceed 1.4. This implies that the DDA dipole discretization is reliable. The index of refraction for ice ( $m$ ) at the six frequencies is obtained from Warren (1984).

The most uncertain aspect of modeling the submm scattering properties of cirrus particles is that of shape. While some characteristic shapes such as columns and bullet-rosettes occur frequently, irregular shapes are probably more common. Thus one cannot hope to model cirrus particle shapes exactly, but can choose a set of realistic shapes that provide a range of scattering properties. Table 2 lists the eight particle shapes modeled here. There are three types of columns, three bullet-rosettes, and two irregulars (stick-ball and spheres). The columns are modeled as cylinders, rather than hexagonal columns, because the submm wavelengths cannot resolve the fine details ( $< 50 \mu\text{m}$ ). The hollow column is a cylinder with cones removed from each end. The spatial rosettes are modeled as cylindrical bullets emanating from the crystal center, with the bullets maximally separated. Particles classified as irregular in microphysical observations are often sublimated crystals, and tend to be rounded, elongated, with some protrusions (otherwise they would be classified as spheres, columns, or rosettes). The “stick-ball” particle shape is a cylinder attached to a sphere of 40% of the particle length, and is meant to simulate one type of irregular particle. Spheres are a particularly unrealistic shape for large cirrus particles and are mainly used for comparison to the other shapes.

One major uncertainty in modeling cirrus particles is that of density. Clearly, when using spheroidal shapes to model crystals it is necessary to model the particles as an ice/air mixture with a density less than solid ice, which is presumably dependent on size. Pristine shapes, such as columns, hollow columns, and bullets on rosettes, would be expected to grow as solid ice by vapor deposition. Since the DDA can model the detailed morphology of these shapes, the density should be that of solid ice. The irregular particles, which are



modeled with an approximate shape, should have a reduced density. Some of the particle shapes were modeled with a reduced density of  $0.60 \text{ g/cm}^3$  (Table 2), using a mixing rule for an ice/air mixture.

Empirical studies indicate that vapor deposition causes ice crystals become thinner (the  $c$  to  $a$  axis length ratio increase) as they grow larger. Thus the aspect ratio of the particles, or the bullets for rosettes, varies with particle size. A power law formula is chosen for the aspect ratio ( $\phi = 2.5(L/100\mu\text{m})^{0.20}$ ), which is within the range of published empirical cirrus aspect ratios. This results in an aspect ratio of 1.58 at  $10 \mu\text{m}$ , 2.50 at  $100 \mu\text{m}$ , and 3.96 at  $1000 \mu\text{m}$ .

All the shapes, except spheres, are assumed to have a preferred orientation. Aerodynamic forces tend to cause the long axes of larger particles to fall horizontally. Laboratory studies (Ono 1969), lidar observations (Platt et al. 1978), and theoretical modeling (Klett 1995) indicate that regular hexagonal particles (larger than  $20 \mu\text{m}$  according to Klett) fall within a few degrees of this horizontal orientation. For the non-rosette shapes the long axis is oriented randomly in the horizontal plane, while rosettes are randomly oriented azimuthally with one bullet pointing down. Four other shapes (including two with an alternate aspect ratio formula, a randomly oriented rosette, and a prolate-spheroid) were modeled for a previous report (Evans 1996), but did not have substantially different radiative properties.

The matrix inversion method of solving the DDA coupled dipole system is used for these simulations (Evans and Stephens 1995a). The scattering properties are computed for eight discrete zenith angles per hemisphere chosen with the Lobatto quadrature scheme. The azimuthal orientation averaging is done with eight incident azimuth angles over 180 degrees. Tests indicated that this level of angular discretization gave negligible error for the largest size parameter.

*b. Polarized radiative transfer model*

The extinction and scattering matrices and emission vector computed by the DDA model are combined with a weighted average over the 21 particle sizes to produce scattering properties for a variety of size distributions (Section 2c.). These scattering properties for a cirrus layer along with the profile of temperature and absorption are input to a radiative transfer model to compute radiances that could be observed by a radiometer. The gaseous absorption for the atmospheric profile is computed by the MPM92 (Millimeter-wave Propagation Model 1992) developed by Liebe (1989).

The polarized radiative transfer model described in Evans and Stephens (1995b) is used to compute radiances. This is a monochromatic plane-parallel model which uses the doubling-adding method for solving the discrete angle radiative transfer system. The azimuthally symmetric geometry implies that only the  $I$  and  $Q$  Stokes parameters are non-zero, thus the radiation is linearly polarized and can be fully described by vertical (V) and horizontal (H) components. The polarized radiative transfer model was modified to compute the radiance at any model level in the atmosphere. The model always uses the Planck function during the radiative transfer procedure, even when converting to brightness temperature.

The issue of how to represent the modeled radiance in terms of brightness temperature becomes a particular concern for the upward looking geometry. For brightness temperatures typical of the downward looking geometry the effective blackbody brightness (EBB) temperature is still linear in the radiance for submm frequencies. For brightness temperatures above about 50°K the EBB and Rayleigh-Jeans brightness temperatures are related by a constant, frequency-dependent offset (21.1 K at 880 GHz) where

$$T_{RJ} \approx T_{EBB} - (0.0240 \text{ K GHz}^{-1})\nu. \quad (1)$$

In this regime the EBB brightness temperature is no longer linearly related to the radiance for upward looking geometries where the Rayleigh-Jeans brightness temperature can be below 25 K. The Rayleigh-Jeans brightness temperature is chosen here because it is linear and goes to 0 K at zero radiance. The Rayleigh-Jeans brightness temperatures will give the same brightness temperature *differences* as the linear brightness temperatures that result from a standard radiometer calibration with blackbody sources.

*c. Modeling procedures*

As in previous modeling (Evans and Stephens 1995a) gamma distributions are used to generate size distributions of cirrus ice particles. Gamma distributions are specified by three parameters and so have the flexibility to represent a desired ice water path, characteristic particle size, and width of the distribution. As shown below gamma distributions represent the aspects of particle size distribution that are relevant for submm radiative transfer quite well. A major departure from the previous work is that the equivalent mass diameter, and not the maximum particle extent, is the basis for the size distribution. The concentration of particles of size  $D$  is

$$N(D) = aD_e^\alpha \exp[-(\alpha + 3.67)D_e/D_{me}] , \quad (2)$$

where  $D_e$  is the diameter of the equivalent mass sphere and  $D_{me}$  is the median mass diameter of the distribution.  $D_e$  depends on the particle diameter  $D$ , but also its shape and density. The width of the distribution is set by  $\alpha$ , and  $a$  is found from the ice mass content. Compared to the maximum particle diameter, the equivalent diameter is more suited for submm radiometry and is used extensively in the radar community. This definition of the characteristic particle size  $D_{me}$  is the same as that used by Matrosov et al. (1994) (their  $D_m$ ). The equivalent mass diameter reduces the microwave radiative differences between particle shapes to those based purely on morphology, which are independent of volume.

The relation between  $D_{me}$  and other measures of particle size depends on shape and  $\alpha$ , but for solid spheres with  $\alpha = 1$ ,  $D_{me} = 2.3r_e$ , where  $r_e$  is the effective radius.

The scattering properties for the gamma size distributions are computed from a weighted average of the scattering properties of the 21 discrete particle sizes. The weights are derived from (2) using an interpolation procedure (Evans and Stephens 1995a). The modeling varies the ice water path from 1 to 1000 g m<sup>-2</sup> in approximately 2 dB steps with the median equivalent diameter ranging from 40 to 400  $\mu$ m in approximately 1 dB steps. Note: because the gamma distribution is truncated at the largest particle length of 1000  $\mu$ m, the highest  $D_{me}$  parameters used here are larger than the true median mass diameter of the resulting distribution. The largest discrepancy due to truncation between the specified gamma distribution  $D_{me}$  and that found from fitting the 2nd and 6th moments (section 3a) occurs for the largest size ( $D_{me} = 400 \mu$ m) and widest distribution ( $\alpha = 0$ ) for the stick-ball shape where the fit  $D_{me}$  is 239  $\mu$ m. The truncation effect is small for  $D_{me}$  below about 200  $\mu$ m.

The brightness temperatures observed by the simulated radiometer are computed with the multi-stream polarized radiative transfer model. The modeled atmosphere is divided into 0.5 km layers up to 40 km. The surface, which is generally unimportant because of the negligible transmission at submm wavelengths, is modeled as a Lambertian surface with an emissivity of 0.95. The cosmic background radiation is negligible at submm frequencies although it is included. The radiances are converted to vertically and horizontally polarized Rayleigh-Jeans brightness temperatures and output at the eight discrete Lobatto zenith angles per hemisphere.

Brightness temperatures computed for a cloud free atmosphere are subtracted from those calculated with a cirrus cloud to get the brightness temperature difference  $\Delta T_b$ . Because cirrus clouds are usually optically thin in the submm the brightness temperature difference

is proportional to the ice water path (IWP). Thus it is appropriate to characterize the measurable effect of cirrus with a measure that normalizes the brightness temperature difference by dividing it by the ice water path ( $\Delta T_b/\text{IWP}$ ). This measure will be referred to as the “sensitivity”. The ice water path used to normalize the brightness temperature takes into account the longer path length for oblique angles. The sensitivity shown is that for the lowest IWP that results in a  $\Delta T_b > 1.0$  K

Climatological lidar data from Virginia (Winker and Vaughan 1994) indicate that cirrus clouds are mostly geometrically thin with a mean thickness near 1 km. Thus all the cirrus clouds modeled here are 1 km thick (it is the IWP that really matters). Previous work (Evans and Stephens 1995b) showed that the microwave radiative characteristics of cirrus were insensitive to the underlying atmosphere, and most of the modeling here uses a standard midlatitude summer atmosphere with cirrus from 12-13 km (tropopause is 13 km). The relative humidity with respect to water of the cirrus layer is always set to 75%. The profiles of temperature, relative humidity, and 880 GHz transmission to space are shown in Fig. 2, for the standard midlatitude summer atmosphere and drier and moister ones. The transmission is high ( $> 0.8$ ) for much of the upper troposphere, but ice clouds can be found at levels where the transmission is not very high (see section 5b for a discussion of these effects). Brightness temperatures are output for two “flight levels” or heights in the atmosphere, one for upwelling radiance above the cloud and one for downwelling radiance below the cloud (for the summer cases the levels are 20 km and 10 km, corresponding to typical flight altitudes for the NASA ER-2 and DC-8 research aircraft).

### 3. Modeling with Observed Cirrus Distributions

Observed particle size distributions are for model runs presented in this section. Two sets of cirrus particle size distributions were obtained from aircraft during the FIRE II

experiment in 1991 in Kansas. The first set is a composite distribution measured on the Sabreliner aircraft with the Video Ice Particle Sampler (VIPS) (McFarquhar and Heymsfield 1996) and the 2D-C probe. The second set was measured on the King Air aircraft with the 2D-C probe. The VIPS probe measured particles down to  $5\text{ }\mu\text{m}$ , while the 2D-C probe on the Sabreliner measured down to  $100\text{ }\mu\text{m}$ , and the 2D-C probe on the King Air measured down to  $25\text{ }\mu\text{m}$ . The cross over point for the composite distributions is  $100\text{ }\mu\text{m}$  (VIPS for smaller particles and 2D-C for larger ones). The composite size distributions from the Sabreliner have crystal habit (shape classification) information, while the King Air distributions have projected area ratio classifications. Data from the two most studied days of FIRE II, November 26 and December 5, were chosen for this analysis. Because the VIPS data were analyzed manually only 50 size distributions (27 for NOV26 and 23 for DEC5) were available for the Sabreliner size distributions. To reduce the number of distributions the 5 second samples of the King Air data were averaged over 60 seconds resulting in 227 distributions during cruising altitudes (152 for NOV26 and 75 for DEC5).

The reason for using both sets of distributions is that the Sabreliner tended to fly in the upper parts of the cirrus clouds on these days biasing the sample towards smaller particles. The King Air flew lower in the clouds, sampling the higher IWC and larger particles, which are closer to the vertically integrated particle sizes. Figure 3 shows the median equivalent mass sphere diameter  $D_{me}$  as a function of ice water content obtained from the size distributions. The  $D_{me}$  is obtained from a fit of the 2nd and 6th moments (see next subsection). Both the Sabreliner and King Air data show a correlation between IWC and particle size. The Sabreliner particles sizes ( $D_{me}$ ) are smaller than  $150\text{ }\mu\text{m}$ , primarily between  $40\text{ }\mu\text{m}$  to  $120\text{ }\mu\text{m}$ , while the King Air  $D_{me}$  spans from  $75$  to  $300\text{ }\mu\text{m}$ .

a. *Gamma distribution equivalence*

The observed size distributions are used in radiative transfer calculations to determine whether gamma distributions can adequately represent real size distributions. This is done by fitting a gamma distribution to each observed distribution and calculating the radiative sensitivities from the observed and gamma distributions. If the sensitivities are very close then the observed distributions are said to be equivalent to the fit gamma distribution.

There are several ways in which gamma distributions could be fit to the observed size distributions. The median equivalent mass sphere could be calculated. This is problematic given the discrete nature of the observed distributions, and does not permit derivation of the width parameter  $\alpha$ . A least squares approach could be used to fit the number concentration, but number concentration is not directly relevant for radiative transfer. Since the particle scattering/radiative transfer process is related to the broad characteristics of the size distribution, the approach taken here is to fit the gamma distribution to moments of the observed  $D_e$  distribution. Two methods of obtaining the equivalent gamma distribution are implemented: 1) fix the parameter  $\alpha = 1$  and calculate the median mass diameter  $D_{me}$  from one moment (the  $N$ 'th), or 2) calculate both  $D_{me}$  and  $\alpha$  from two moments (the  $N1$ 'th and  $N2$ 'th). In all cases the gamma distribution is required to have the same mass content (equivalent to constraining the third moment). If  $M_N$  is the  $N$ 'th moment of the equivalent diameter

$$M_N = \sum_i n_i D_{e,i}^N, \quad (3)$$

then  $\alpha$  may be obtained by solving

$$\left(\frac{M_{N2}}{M_3}\right)^{1/(N2-3)} \left(\frac{M_3}{M_{N1}}\right)^{1/(N1-3)} = \left(\frac{\Gamma(\alpha + N2 + 1)}{\Gamma(\alpha + 4)}\right)^{1/(N2-3)} \left(\frac{\Gamma(\alpha + 4)}{\Gamma(\alpha + N1 + 1)}\right)^{1/(N1-3)}. \quad (4)$$

Given  $\alpha$ , the median mass diameter is calculated from

$$D_{me} = (\alpha + 3.67) \left[ \frac{M_{N1}}{M_3} \frac{\Gamma(\alpha + 4)}{\Gamma(\alpha + N1 + 1)} \right]^{1/(N1-3)} \quad (5)$$

These formulas assume an untruncated gamma distribution.

Various pairs of moments and single moments (with  $\alpha = 1$ ) are tried in the gamma distribution fitting. The distributions with largest sizes ( $D_{me}$ ) have narrow distribution widths (high  $\alpha$ ). The higher moment fit tends to fit the large particle mode and greatly underestimate the concentration of small particles. The resulting  $\alpha$  range from a lower limit of -0.5 to about 7, and are larger than those reported elsewhere (Kosarev and Mazin 1989) because higher order moments, rather than the number concentration is being fit.

To determine whether these gamma distributions derived from the observed size distributions are equivalent in a radiative sense, brightness temperatures at 340 and 630 GHz are computed from modeled cirrus clouds with observed and theoretical gamma size distributions. Cirrus clouds with either columns or five bullet rosettes and an IWP of 10 g/m<sup>2</sup> are modeled. Sensitivities ( $\Delta T_b/IWP$ ) are analyzed for five viewing angles/polarizations (0°, 26°V, 26°H, 49°V, 49°H) and both upward and downward viewing geometries.

The criterion for radiative equivalence is the absolute value of the fractional difference in sensitivity. The Sabreliner and King Air data are analyzed separately because of the marked difference in the measured size distributions. The 50 and 90 percentiles of the fractional differences in sensitivity are tabulated in Tables 3 and 4. The first table has the results for fixing  $\alpha = 1$  and fitting the ice mass and median equivalent diameter  $D_{me}$ . For the smaller particle distributions (Sabreliner) and the lowest frequency (340 GHz) the size parameter is small and the moment that provides the best fit is the 6'th indicating that Rayleigh scattering dominates. When the particle sizes approach the submm wavelengths the best fitting moment is the 4'th. This results in the observed and gamma distribution having sensitivities within 5% for half of the cases and within 15% for ninety percent the cases.



Table 4 shows that even better submm radiative equivalence can be achieved if both  $D_{me}$  and  $\alpha$  are fit. If the 4th and 6th moments are fit then 90% of the cases have sensitivities within 6%. There are a few cases where using a fit gamma distribution to represent an actual size distribution leads to larger errors. However, it should be kept in mind that the submm radiometry technique is for determining vertically integrated cirrus properties, and these integrated distributions will tend to be smoother and more regular than individual distributions.

The results in Tables 3 and 4 indicate that the submm radiometry signal is proportional to the third to the fifth moment of the cirrus particle size distribution. This allows submm radiometers to complement other sensors that are sensitive to different moments of the size distribution. Visible and infrared sensors are sensitive to second moment and mm radars are sensitive to the sixth moment. Results for these two moments yield a somewhat larger radiative error with 90% of the cases having sensitivities within 13%. Thus the gamma distribution, fit with the appropriate moments, should be able to represent cirrus observed with instruments spanning from visible to millimeter wavelengths.

#### *b. Ice water path – $\Delta T_b$ relations*

The size distributions observed during FIRE are also used to model the relation between brightness temperature differences ( $\Delta T_b$ ) and ice water path (IWP). The ice crystal shape information is available for the Sabreliner VIPS/2DC size distribution, and so appropriate assignments are made from the NCAR crystal habit codes to four of the shapes modeled here (coln, rs5o, stik, sphr). Most of the crystals shapes identified in the VIPS distributions are quasi-spherical (sphr). Since only the area ratio classification is available for the King Air 2DC probe, these distributions are simply modeled with the five bullet rosettes (rs5o). The cloud probe size distributions are assumed to give the number concentration of particles

with a maximum length of the probe bin center.

The brightness temperature differences computed from the observed size distributions are shown for all six frequencies in Figs. 4 and 5. Since the Sabreliner data has smaller particles and lower ice water content, the  $\Delta T_b$  are quite small (under 4 K at 630 GHz) compared to the King Air data. The Sabreliner points are also shifted to higher  $\Delta T_b$  at the highest frequencies because of the greater sensitivity of solid ice spheres, which make up the bulk of the Sabreliner distributions, as compared with the sensitivity of rosettes. Since only one shape is modeled for the King Air distributions the scatter is due to variations in characteristic particle sizes. Besides increased sensitivity, the scatter about a power law relation between IWP and  $\Delta T_b$  is reduced at the higher frequencies. The reasons for these behaviors will be discussed later.

These figures show that the  $\Delta T_b$  for a given ice water path increases dramatically with radiometer frequency. The largest  $\Delta T_b$  is only 2.3 K at 150 GHz and 63 K at 880 GHz. A brightness temperature depression of  $\Delta T_b = 1$  K corresponds to IWP's of 49, 26, 12, 6, 4, 2 g m<sup>-2</sup> for 150, 220, 340, 500, 630, and 880 GHz respectively, showing the benefit of submm frequencies for observing cirrus.

To summarize these results, regressions (log-log) are performed for IWP as a function of  $\Delta T_b$ . Table 5 lists the regression results for the King Air distributions having  $\Delta T_b > 0.3$  K for 150, 200, and 340 GHz and  $\Delta T_b > 1.0$  K for 500, 630, 880 GHz. The IWP corresponding to  $\Delta T_b = 1$  K (coefficient  $a$ ) decreases with increasing frequency. The slope  $b$  also increases with frequency as  $\Delta T_b$  becomes less sensitive to particle size. The rms fractional error decreases with increasing frequency. The errors at higher frequencies (20-30%) are due to the relatively good correlation of IWP and particle size in the King Air dataset and does not treat uncertainties due to varying particle shape. These types of regression relations suggest a simple retrieval algorithm that could be used for a single frequency submm radiometer. In

this case the variation of particle size as well as particle shape would be sources of error. The problem with this approach is that the regression coefficients depend on the characteristics of the microphysical dataset employed, and would not be generally applicable. In particular, these FIRE King Air distributions are not representative of all cirrus clouds, because they are biased towards high IWP and large particles.

## 4. Modeling Results

### *a. Sensitivity properties*

The basic results of the mm-wave and submm-wave radiative transfer modeling for various cirrus cloud properties are described in terms of the sensitivity. The radiometric signal produced by a cirrus cloud is the change in brightness temperature ( $\Delta T_b$ ) between a cloudy and cloud-free sky assuming identical atmospheric gas and temperature profiles. The sensitivity is  $\Delta T_b$  normalized by ice water path along the viewing direction,  $S = \frac{|\Delta T_b|}{IWP}$ . The sensitivity is constant in the linear regime of radiative transfer. As a rule of thumb, the radiative transfer is linear (to within 10%) for  $\Delta T_b < 30^\circ\text{K}$ , above which the sensitivity falls significantly. In this section the ice clouds are modeled by gamma distributions specified by the IWP, the median equivalent mass sphere diameter  $D_{me}$ , and the width parameter  $\alpha$ . The modeled cirrus cloud top is at the tropopause in a standard midlatitude summer atmosphere.

Figure 6 illustrates the value of submm frequencies for cirrus remote sensing. For characteristic particle sizes typical of cirrus clouds the sensitivity increases rapidly with frequency, and only frequencies above 500 GHz have adequate sensitivity ( $> 0.1 \text{ K g}^{-1} \text{ m}^2$ ) to detect cirrus. The sensitivity curves for the large  $D_{me}$  appear to approach a limit because the gamma distributions are truncated at a particle size of  $1000 \mu\text{m}$ .

The effect of particle size on nadir sensitivity may be seen in Figs. 7 and 8. For low

frequencies the sensitivity increases continuously with particle size, but for higher frequencies the sensitivity increases for smaller particles sizes and then levels off as the particle size approaches the wavelength. The constant sensitivity is highly desirable, because it implies that the  $\Delta T_b$  signal is proportional to cloud ice water path. The particle size at which the sensitivity levels off decreases with increasing frequency, so that for 880 GHz the sensitivity is relatively independent of particle size for  $D_{me} > 100 \mu\text{m}$ . Using a threshold of  $\Delta T_b > 2 \text{ K}$  at 880 GHz, IWP could be detected down to  $5 \text{ g m}^{-2}$  for size distributions with  $D_{me} > 125 \mu\text{m}$ . The higher frequencies not only provide a greater sensitivity to cirrus, but also a reduced dependence of IWP on particle size.

The effect of particle shape is evident in Figs 7 and 8. For the smaller sizes and lower frequencies the ice particles are in an absorbing regime (low single scattering albedo). Since the absorption is proportional to volume there is little variation in sensitivity with shape. With increasing size parameter particle shape becomes more important. The maximum range in nadir sensitivity due to particle shape is 3.6, 3.2, 2.6, 2.4, and 2.3, for 220, 340, 500, 630, and 880 GHz. For the most part, the sensitivity of columns is well above that of the rosettes. This may be understood from the single scattering properties. Figure 9 shows the extinction and forward scattering ratio for seven shapes as a function of  $D_{me}$ . High density columns have both higher extinction and lower forward scattering ratio as compared to rosettes or other lower density shapes. Both of these characteristics increase the brightness temperature difference (consider the first order radiative transfer results in appendix A). Based on in situ microphysical observations it is likely that a prevalence of large columns is quite rare in cirrus clouds (Heymsfield and Platt 1984). How shapes change the relative sensitivities with  $D_{me}$  indicates that the radiative properties are not simply a function of particle size and bulk density, but also are affected by gross morphological features.

The sensitivity for horizontal and vertical polarization using a  $49^\circ$  downward looking

view angle is shown in Fig. 10. The 49V sensitivity tends to be below that at nadir, while the 49H sensitivity tends to be above. There is a substantial polarization effect due to the larger horizontal than vertical cross section for the oriented particles. The range in sensitivity from shape is less for vertical than for horizontal polarization. Excluding spheres as unrealistic, the maximum range of sensitivity at 630 GHz is 1.7 for vertical and 2.3 for horizontal polarization.

The correspondence of upward and downward viewing geometry for submm sensing of ice clouds is shown in Fig. 11. The sensitivity viewing upward or downward is nearly the same except for the smaller size distributions. This is expected from the first order radiative transfer model (Appendix A). The larger size distributions have a single scattering albedo near unity (mainly scattering) and so the upwelling and downwelling sensitivities are very close. The smaller size distributions are more absorbing and so the radiation that is emitted reduces the brightness temperature decrease for upwelling radiation but augments the brightness temperature increase for downwelling radiation.

The dependence of sensitivity on viewing angle is shown in Fig. 12 for three particle sizes. Since the sensitivity includes the path length effect, the actual increase in  $\Delta T_b$  at oblique angles is not indicated by these plots. Excluding spheres, the range of vertically polarized sensitivity caused by varying particle shape decreases with viewing angle. The largest particle size also shows an increase in sensitivity for greater viewing angles. The spherical particle shape, which is a reasonable approximation to the average sensitivity for nadir viewing, substantially overestimates the vertical polarization sensitivity at oblique angles.

The variation of sensitivity with gamma size distribution width (as measured by  $\alpha$ ) is shown in Fig. 13. Here  $\alpha$  is varied from 0 (wide) to 7 (narrow). The wider distributions cause less change in sensitivity with  $D_{me}$  than do the narrower distributions. The effect

of the size distribution width on the sensitivity tends to be smaller than the effect due to particle shape.

*b. Observable signatures of particle size and shape*

Sensitivity is primarily dependent on particle size, and thus accurate retrieval of IWP requires knowledge of particle size. As discussed in Evans and Stephens (1995b) the  $\Delta T_b$ 's at two different microwave frequencies contain information about particle size. Figure 14 shows the size distribution parameter  $D_{me}$  as a function of the ratio of the  $\Delta T_b$ 's. The ratio of  $\Delta T_b$  at 340 GHz to  $\Delta T_b$  at 220 GHz does not uniquely determine particle size, and is only be useful for  $D_{me} > 200 \mu\text{m}$ . The ratios of  $\Delta T_b$  at 630 and 500 GHz is smaller because these two frequencies are relatively close. The 630/500 GHz pair does not distinguish the smaller particle sizes ( $D_{me} < 100 \mu\text{m}$ ) very well. The ratio of  $\Delta T_b$  at 880 and 630 GHz can be used to determine the median particle size over a wider range of sizes ( $\sim 65 \leq D_{me} \leq \sim 200 \mu\text{m}$ ). For larger particles the ability to discriminate particle size with the 880/630 GHz pair is limited. In this regime, however, the sensitivity is independent of size, so the determination of IWP is minimally affected.

The polarization signature and its relation to particle shape is shown in Fig. 15. The  $\Delta T_b$  ratio of horizontal to vertical polarization at 880 GHz is plotted against the  $\Delta T_b$  ratio at 880 GHz to 630 GHz for vertical polarization at  $49^\circ$ . Thus the abscissa is the dual frequency axis (indicating particle size) and the ordinate is the polarization axis. There is a rough sorting by shape with the columns having a larger polarizing signature than the rosettes or irregular shape. This is a results of columns having horizontal orientation and a thinner aspect ratio. At a viewing angle of  $49^\circ$  for 880 GHz, a polarization ratio of 1.4 could be used as a criterion for discriminating between rosettes and columns. The polarization signature at this frequency is useful for distinguishing between these shapes for

particle sizes in the range  $\sim 65 \leq D_{me} \leq \sim 200 \mu\text{m}$ . Cirrus clouds have a variety of rosette shapes in various orientations so the polarization would be less than modeled. Actual cirrus clouds contain a mixture of shapes and so the polarization signature will be more difficult to interpret. However, polarization measurements should be pursued to further investigate their value in retrieving particle shape information.

## 5. Retrieval Method and Error Analysis

### *a. Determining $\Delta T_b$*

The measured radiometric signal,  $T_b$ , is the sum of the ice cloud effect,  $\Delta T_b$ , and the clear sky “background” brightness temperature,  $T_{b0}$ . Thus the background  $T_{b0}$  must be inferred to derive the desired  $\Delta T_b$ . In the simple case where no midtroposphere liquid clouds are present, the background brightness temperature is due to the water vapor emission. One way to obtain the background  $T_{b0}$  is to average nearby clear sky pixels, and assume continuity of the atmospheric profile. The error in this “pixel differencing” technique for  $\Delta T_b$  depends on the local structure of the temperature and water vapor profiles. The variability in brightness temperature of the MIR  $183.3 \pm 1$  GHz channel (which matches submm water vapor absorption reasonably well) was analyzed in Deeter and Evans (1997). Autocorrelation analysis of more than 900 km of cirrus scenes in the Tropics indicated the rms variability in  $T_b$  for a 30 km correlation length (i.e. distance between cirrus and clear sky patch) was about 1.5 K. The variability is probably greater in more complex meteorological conditions, such as midlatitude frontal regions. A separate paper, in preparation, will examine the effect of water vapor inhomogeneities on upwelling brightness temperature at selected submm frequencies (S. Walter).

A much more accurate technique for obtaining  $\Delta T_b$  is to use a 183 GHz radiometer to predict the background submm brightness temperature. A water vapor line is located at

183 GHz, which can be used to match the water vapor opacity at submm frequencies. The 183 GHz frequency is also relatively insensitive to cirrus induced scattering (for high IWP and large particles that can slightly affect the 183 GHz channel, the  $\Delta T_b$  at 183 GHz from an ice cloud would be obtained iteratively in the retrieval process). Modeling is performed to estimate the ability of the 183 GHz channel to predict the clear sky brightness temperature at 643 GHz, a frequency studied for space applications. Atmospheric profiles are generated by setting the relative humidity at each tropospheric level to a random value between 20% and 80%. The temperature is varied at each tropospheric level uniformly from the standard atmosphere by -2 to 2 K. For each of four standard profiles, 100 profiles are generated, and the 183 GHz and submm brightness temperatures computed. The frequency offset from the 183 GHz line center was varied to find the best match in water vapor transmission profiles, which occurred at  $\pm 1.6$  GHz from line center. An integration over the radiometer bandwidths was included. Figure 16 shows the 643 GHz  $T_b$  vs. the 183 GHz channel  $T_b$  for the four standard atmospheres. The shift between the warm and cold atmospheres is due to differences in the pressure dependence of the submm windows (line wings) and the 183 GHz frequency (line center). Auxiliary information could be used to constrain the temperature profile. Therefore the scatter about the linear regression calculated for each standard profile gives the accuracy of this technique. The rms uncertainty in the predicted submm background  $T_{b0}$  is less than 0.25 K for each atmosphere.

*b. Effects of atmospheric absorption*

Because of water vapor opacity, a submm radiometer is sensitive only to upper tropospheric clouds, which are above the bulk of the water vapor. Fig. 2 shows submm transmission profiles in atmospheres of varying water vapor content. The reduced transmission also decreases the sensitivity to lower, warmer ice clouds. Even in a completely saturated



troposphere the transmission at submm window frequencies is greater than 0.8 down to about the -40 C level. In addition to the direct transmission effect, the sensitivity is also decreased due to backscattering of downwelling radiation incident on the cloud (as absorption increases above the cloud there is more emission from vapor incident on the cloud). These effects are understood with the first order radiative transfer model in Appendix A. It is shown that the sensitivity compared to having no absorption in and above the clouds is reduced by the factor  $T_o T_a^D$ , where  $T_o$  is the transmission from the cloud to the observer,  $T_a$  is the nadir transmission above the cloud, and  $D$  is the diffusivity factor (e.g.  $D = 1.5$ ). Besides the water vapor transmission effect, the atmosphere affects the sensitivity because  $\Delta T_b$  is proportional to the upwelling radiance. These two effects may be combined to define a corrected sensitivity  $S$ ,

$$S = S_{obs} \frac{250 \text{ K}}{I \uparrow_{clr}} \frac{1}{T_o^{1/\mu} T_a^D}, \quad (6)$$

where  $S_{obs}$  is the original sensitivity and  $I \uparrow_{clr}$  is the upwelling clear sky brightness temperature. To illustrate how the sensitivity is reduced as the cirrus height decreases, a number of atmospheric profiles and cirrus layer heights are modeled (see Fig. 17). The modeled atmospheres are standard summer and winter midlatitude temperature profiles with three relative humidity profiles (dry, standard, and wet) for summer and winter. Five cloud top heights from the tropopause down are modeled. As the cloud height is lowered the sensitivity is reduced substantially, though the correction method (6) works quite well for nadir transmission above 0.5.

The accuracy of the correction procedure for cirrus height is quantified by calculating the spread in sensitivity. The maximum range, computed separately for the three relative humidity profiles, is over nine size distributions, two particle shapes, and five cirrus levels. A correction is attempted only when the nadir transmission to the cloud is greater than 0.5. The range in sensitivity at 500 GHz is listed in Table 6. The success of the sensitivity

correction shows that the atmospheric transmission effect is well understood.

With a measurement of upper tropospheric water vapor (i.e. from 183 GHz water vapor line measurements or from infrared water vapor channels above the cloud) and the height of the cirrus cloud (from radar, lidar, thermal IR estimate, etc.) then the submm water vapor transmission could be estimated and the correction applied. On the other hand, the sensitivity variation with transmission can be used to define what are upper tropospheric ice clouds. The transmission curve prevents a space-based submm radiometer from seeing middle and lower troposphere clouds. The “filter” selecting the observation altitudes is the atmospheric transmission to about the 2.5 power. This filter depends primarily on temperature (assuming average relative humidities) and can be applied to climate model simulations to define “upper tropospheric ice mass”.

*c. A two-channel retrieval algorithm*

Ice water path and particle size are the primary determinants of submm  $\Delta T_b$ . Figure 14 showed that two separate frequencies may be used to separate particle size from IWP. A simple two-channel algorithm (Evans et al. 1996) was developed that used the ratio of  $\Delta T_b$  at two frequencies to predict the sensitivity with a regression relation. Since the IWP was determined from the sensitivity, this required linearity in the radiative transfer. Here a more sophisticated Bayesian algorithm is used to retrieve the IWP and size distribution  $D_{me}$  from measurements at two frequencies. The effects of size distribution width ( $\alpha$ ), particle shape, and radiometer noise/background error are considered as error sources.

The 11  $D_{me}$  and 16 IWP used for the radiative transfer simulations form a retrieval grid. The simplest way to use this grid would be to find the IWP- $D_{me}$  pair that minimize the difference between the observed and simulated  $\Delta T_b$ . This approach performs poorly, however, because the correlation between the two channels results will amplify measurement

noise and other uncertainties. Thus as with many remote sensing algorithms that use first guesses or statistical methods, a priori information must be added. The following Bayesian algorithm supplies a priori information about particle size. Unless there is strong reason to believe from the observations that the particle size is small, it is safer to assume a larger particle size where the sensitivity–particle size relation is flat. The prior distribution thus prevents errors in  $\Delta T_b$  from biasing the solution towards smaller particle size and larger IWP.

The addition of extra information is done formally with Bayes theorem (Larson 1982). The posterior probability distribution  $P_{post}$  is related to the prior probability distribution  $P_{prior}$  and the conditional distribution  $P_{cond}$  by

$$P_{post}(IWP, D_{me}|\Delta T_1, \Delta T_2) \propto P_{prior}(IWP, D_{me})P_{cond}(\Delta T_1, \Delta T_2|IWP, D_{me}) . \quad (7)$$

The conditional distribution represents the forward radiative transfer problem (the  $\Delta T_b$  given the cirrus properties) and is assumed to be of bivariate normal form. The distribution mean and covariance parameters for each IWP– $D_{me}$  grid point are obtained from the  $\Delta T_b$  simulated for the particle shapes and size distribution widths (28 cases derived from seven shapes and four  $\alpha$ 's) combined with an assumed level of uncorrelated Gaussian noise. The prior distribution is assumed to be a log-normal distribution in  $D_{me}$ , specified by a geometric mean and standard deviation of the log chosen subjectively.

The IWP retrieval is done in a two step process (see Fig. 18). First, the geometric mean relation between the  $\Delta T_b$  at the higher frequency and corresponding IWP is found for each  $D_{me}$  grid value. Thus for a given observation ( $\Delta T_2$ ), the IWP corresponding to each grid  $D_{me}$  is found. The required particle size information comes from the Bayes posterior probability. The retrieved IWP is computed by weighting the  $IWP(D_{me})$  by the posterior probability and summing over all the retrieval grid points. The retrieved  $D_{me}$  is found more directly by computing the mean  $D_{me}$  over the grid using the posterior probability. However,

so as to not bias the  $D_{me}$  retrieval, the prior distribution is taken to be uniform. The best choice of  $D_{me}$  prior distribution parameters depend on the frequency pair and observation angle being considered.

*d. Retrieval error analysis*

The algorithm described in the last section is used to perform an error analysis to estimate the accuracy of the submm radiometric technique for sensing cirrus cloud properties, primarily IWP. A Monte Carlo procedure is used to perform the error analysis. This involves adding noise to the modeled  $\Delta T_b$ 's then using the two channel retrieval algorithm to invert for IWP and  $D_{me}$ . The error is estimated with a comparison of the retrieved IWP and  $D_{me}$  with the input values. For each of the 11 discrete  $D_{me}$  and 16 ice water paths the Monte Carlo procedure is performed with 15 realizations of Gaussian noise added to the simulated  $\Delta T_b$  for seven particle shapes (excluding spheres) and four size distribution  $\alpha$ 's. The noise at each frequency is assumed to be uncorrelated and has an rms of 0.5 K, which is a realistic estimate of the noise floor. Retrievals are not made for realizations with either "observed"  $\Delta T_b$  below two standard deviations above the rms noise level (0.5 K). The retrieved values are compared to the true values in a relative sense by computing the rms of the difference in the logarithms of the values. The rms of the log difference is then exponentiated to obtain the error factor. Thus, an rms error factor of 1 indicates no error, while an error factor of 2 means an rms range from -50% to +100%. For small rms error factors, 1 may be subtracted to obtain the one standard deviation fractional error (e.g. a factor of 1.3 implies about 30% error).

The visible optical depth corresponding to the range of IWP and  $D_{me}$  is shown in Fig. 19. To visualize how the accuracy varies with ice cloud properties, the rms error factor is displayed as contour plots of IWP and  $D_{me}$ . Regions beyond an error factor of

2 or where the noise threshold is not reached for half of the cases are not contoured. The IWP error analysis is shown for three frequency pairs (220/340, 500/630, and 630/880) for nadir downward viewing in Fig. 20. The 220/340 GHz pair yields the worst performance and is insensitive to most cirrus. The accuracy and range of utility improve with the higher frequencies. The 630/880 retrieval accuracy achieves an error factor of 1.4 or below for IWP above  $5 \text{ g/m}^2$  and  $D_{me}$  above  $100 \text{ }\mu\text{m}$ . Where there is sufficient signal-to-noise the majority of the error is caused by uncertainty in particle shape. Since columns have significantly higher sensitivity than the rest of the shapes, and are rare in cirrus clouds, it is interesting to consider the IWP retrieval errors without columns (Fig. 21). The rms errors for 630/880 GHz are below 30% for IWP  $> 10 \text{ g/m}^2$  and  $D_{me} > 100 \text{ }\mu\text{m}$ , and are below 20% for higher IWP.

Since cirrus clouds are layer clouds with horizontal dimensions typically 100 km or more, oblique viewing angles ( $0.1 < \cos \theta < 0.3$ ) offer a simple way to increase the radiometer sensitivity to a given amount of vertically integrated ice water path. The radiometer field of view (footprint) expands for oblique viewing angles, but the linear nature of submm radiometry still integrates over cloud inhomogeneities to provide the total ice mass. Figure 22 shows the rms error factor for IWP and  $D_{me}$  at  $\cos \theta = 0.3$  ( $\theta = 73^\circ$ ) viewing angle. Using horizontal polarization at 630/880 GHz further improves the sensitivity. For this oblique angle the IWP errors are worse for small particle sizes, but the 1.4 rms error factor contour now goes down to IWP  $= 1 \text{ g/m}^2$  (or visible optical depth below 0.1).

This error analysis is inherently dependent on the modeling assumption. The baseline cases may be conservative, since a wide range of  $\alpha$  (0 to 7) is used and actual particle shapes may not have as great a range of submm scattering properties as the seven considered here. It is difficult to accurately quantify the error due to particle shape until more is known about cirrus particle shapes globally. While the 183 GHz technique for determining the  $\Delta T_b$  from

the observed brightness temperature is highly accurate for water vapor and temperature variations, supercooled water clouds will undoubtedly increase the error in some multilayer cloud situations. The effect of water vapor absorption on sensitivity is not included in this error analysis, and perhaps is best thought of as a filter reducing the sensitivity to lower ice clouds.

*e. A combined mm radar-submm radiometer method*

Recently, aircraft based millimeter-wave radars, such as the NASA 94 GHz Airborne Cloud Radar developed jointly by JPL and the Univ. of Massachusetts, have been shown to be a powerful new method for sensing the cirrus cloud profiles. Radars measure cirrus sized particles by Rayleigh scattering, and thus sense the sixth moment of the size distribution. Additional constraints on particle size are required to infer cloud ice mass with a radar. A submm radiometer can provide the requisite particle size information.

The 94 GHz nadir radar reflectivity is simulated using the DDA technique for the same ice particle shapes and gamma size distributions used in the radiometer analysis. Since submm radiometry measures a vertical integral of cirrus properties, the vertically integrated reflectivity (IZ) is the appropriate observable. Figure 23 shows the vertically integrated reflectivity sensitivity (i.e. ratio to IWP) as a function of particle size. Since the ice water path depends on the third moment, the reflectivity sensitivity increases with the third power of the size distribution  $D_{me}$ . The deviation from the  $D_{me}^3$  line for large particles is primarily due to the gamma distribution truncation at 1 mm particle size. The range in reflectivity sensitivity (factor of 2.1 at  $D_{me} = 100 \mu\text{m}$ ) is mainly caused by the size distribution width ( $\alpha$ ) rather than particle shape as is the case for submm radiometry. The bottom panel in 23 illustrates that the differing dependence on particle size between radar and submm radiometry may be used to infer  $D_{me}$  using the ratio of the two observables. Due to the

decrease in 630 GHz sensitivity for smaller particles, the combined technique is less able to distinguish the smaller particle sizes.

The same Bayesian algorithm employed above is used to perform a Monte Carlo error analysis of a combined radar/radiometer algorithm. The submm radiometer noise is assumed to dominate the radar noise (the radar usually would be far more sensitive). It proved more accurate to use the radiometer  $\Delta T_b$ -IWP relationship rather than the radar IZ-IWP relationship. The rms error factors for IWP and  $D_{me}$  for the 94 GHz radar/630 GHz radiometer combination with a nadir viewing geometry is shown in Fig. 24. The strongly differing dependence on particle size leads to rms errors of only 10% to 30% in particle size. The IWP error is larger than for a purely submm radiometer technique, because only a single submm radiometer frequency is used. Figure 25 shows that much of the IWP error is due to particle shape, and excluding the columns reduces the error to under 30% for  $IWP > 10 \text{ g/m}^2$  and  $D_{me} > 100 \text{ }\mu\text{m}$ .

## 6. Summary and Conclusions

The submm radiometry technique for remote sensing cirrus clouds is explored with theoretical modeling. The scattering properties for eight particle shapes ranging from  $10 \text{ }\mu\text{m}$  to  $1000 \text{ }\mu\text{m}$  are modeled with the discrete dipole approximation. The brightness temperature change ( $\Delta T_b$ ) due to cirrus clouds is simulated at 150, 220, 340, 500, 630, and 880 GHz with a polarized radiative transfer model. Observed ice cloud particle size distributions from FIRE II are modeled, and it is demonstrated that gamma size distributions are radiometrically equivalent if fit with moments of the equivalent diameter (e.g. 2nd and 6th).

The effect of various cirrus properties is quantified with the *sensitivity*, which is the ratio  $\Delta T_b/IWP$ , where IWP is the cirrus ice water path. Cirrus properties are modeled with gamma size distributions specified by the median mass equivalent sphere diameter  $D_{me}$ .

The sensitivity increases dramatically with frequency, so that at 880 GHz for nadir view an IWP of only 5 g/m<sup>2</sup> produces an easily measurable change in brightness temperature of  $\Delta T_b > 2$  K for size distributions with  $D_{me} > 125$   $\mu$ m. For submm frequencies the sensitivity increases with crystal size for small particles, but then levels off indicating that the  $\Delta T_b$  signal is directly proportional to IWP. Column shaped ice particles have higher sensitivity than rosettes. The brightness temperature increase for an upward looking geometry is found to be about the same as the brightness temperature decrease for a downward viewing geometry. The ratio of  $\Delta T_b$  at two frequencies is a good measure of particle size over a substantial range. Atmospheric transmission is high enough in the submm windows to allow upper tropospheric sensing from both space and research jet aircraft. Absorption by water vapor reduces the sensitivity to lower cirrus clouds, however, a method for “correcting” the sensitivity permits interpretation of clouds down to where the atmospheric transmission falls to 0.5.

The most promising method for obtaining the desired  $\Delta T_b$  from the observed  $T_b$ , is to derive the background “clear sky” brightness temperature from a radiometric measurement at the 183 GHz water vapor line. This 183 GHz frequency is insensitive to cirrus and can match the water vapor transmission characteristics of the submm channels. With this method the clear sky  $T_b$  is predicted with an rms error of less than 0.25 K (even with large temperature and relative humidity variations). A two-channel retrieval algorithm for IWP and  $D_{me}$ , which uses Bayes theorem to introduce a priori information about particle size, is described. This algorithm is used with a Monte Carlo error analysis to estimate the retrieval errors due to particle shape, size distribution width, and 0.5 K rms noise. The error analysis shows that the 220/340 GHz measurement pair is insensitive to most cirrus. The 630/880 GHz measurement pair for nadir viewing yields an rms errors of 30% to 40% for IWP when IWP > 5 g/m<sup>2</sup> and  $D_{me} > 100$   $\mu$ m, and similar errors for IWP > 1 g/m<sup>2</sup> and



$D_{me} > 125 \mu\text{m}$  for a viewing zenith angle of  $73^\circ$ . The same Bayesian algorithm is used to perform an error analysis on a combined 94 GHz radar/630 GHz radiometer technique. The combined method has rms errors of 10% to 30% for  $D_{me}$  and 30% to 60% for IWP. These error estimates depend on the modeling assumptions, which were chosen to be conservative.

The largest uncertainty in modeling submm scattering by cirrus is the effect of particle shape. Although analyses of simulated radiances at orthogonal polarizations indicates that retrieving particle shape is difficult, it should be pursued further. In the future, in situ measured cirrus particle shape information could be used to develop shape retrieval techniques and more reliable estimates of the retrieval error. The real test of the submm radiometric technique will be observing cirrus clouds with a submm radiometer and comparing retrieved properties obtained with in situ and other remote sensing methods.

The analyses in this paper provide a theoretical basis for proposing characteristics for a dedicated radiometer for sensing cirrus clouds. It should have the following characteristics 1) multiple frequencies for good sensitivity over a wide range of IWP and particle size, 2) a 183 GHz channel for determining the atmospheric emission background, 3) ability to scan to large viewing angles to achieve greater sensitivity, 4) as low noise as possible (i.e. below 0.5 K), and 5) dual polarization capability. The spacing of frequencies is a tradeoff: a greater separation result in a larger ratio of  $\Delta T_b$  for determining particle size, but that also reduces the signal-to-noise at the lower measurement frequency. Based on matching the atmospheric transmission characteristics and constant ratios between the submm channels, a radiometer with channels at 183, 495, 665, and 890 GHz is recommended for remote sensing cirrus properties. There are also atmospheric windows near 1350 and 1500 GHz, which could be useful for sensing small cirrus particles, but these windows have significantly lower transmission. A radiometer dedicated to investigating clouds would include millimeter-wave and microwave channels for sensing tropospheric water vapor, liquid clouds, and precipita-

tion. Finally, a submm radiometer for sensing cirrus would be complemented by visible and infrared instruments, to supplement the submm retrievals with visible optical depth, cloud temperature, optically thin cirrus detection, and sizes of small particles.

*Acknowledgements:* The authors thank Graeme Stephens for his support for this new submm radiometric technique (to the point of including it in a satellite mission proposal). Steve Aulenbach (funded by NASA FIRE-III grant L55549D) helped prepare the FIRE microphysical datasets and provided valuable guidance in their use. Financial support to KFE and MND for this research was provided by NASA FIRE-III grant NAG1-1702 and the JPL Director's Research and Development Fund. The work described in this paper was partially carried out by the Jet Propulsion Laboratory, California Institute of Technology, under a contract with the National Aeronautics and Space Administration. Financial support to SJW was provided by both the JPL Director's Research and Development Fund and NASA RTOP 460-4254.

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## A First Order Radiative Transfer Model

A simple first order scattering radiative transfer model is quite useful for understanding behavior of the radiance from different cirrus properties. The model presented here is a generalization of the one presented in previous work (Evans and Stephens 1995a). The assumptions of the model are that 1) the cloud is optically thin at submm frequencies so the first order scattering approximation may be made, 2) the incident radiation is unpolarized and hemispherically isotropic, and 3) there is no reflection from the rest of the atmosphere. Here we allow there to be gaseous absorption in and above the cloud so there is incident radiation from above. Consider a cirrus layer with the incident radiance  $I_b \uparrow$  at the bottom of the cloud and  $I_t \downarrow$  at the top. The problem is to find the change in outgoing radiance due to the cirrus cloud at the bottom  $\Delta I_b \downarrow$  and at the top  $\Delta I_t \uparrow$ . The cirrus cloud scattering properties are specified by the optical path  $\tau$ , single scattering albedo  $\omega$ , and the forward scattering ratio  $f$ . The gaseous absorption optical path within the cloud is  $\tau_g$ . All of these properties and the outgoing radiances depend on the zenith angle (or  $\mu$ ) and the polarization; the optical paths includes the path length effect for the angle. For a particular upwelling outgoing angle the forward scattering ratio is the ratio of the integral of the scattering matrix over upwelling incident angles to the integral over all angles. It is assumed that the cirrus properties are the same for upward and downward directions at the same angle. The Planck blackbody function at the frequency in question and the mean cloud temperature is  $B_c = B_\nu(\bar{T}_c)$ .

If the gaseous optical depth in the cloud layer is small then the clear sky outgoing radiance is

$$\begin{aligned} \text{Clear : } I_t \uparrow &= (1 - \tau_g)I_b \uparrow + \tau_g B_c \\ I_b \downarrow &= (1 - \tau_g)I_t \downarrow + \tau_g B_c \end{aligned} \tag{8}$$

The outgoing radiance from the cirrus particles and gas is

$$\begin{aligned}\text{Cirrus : } I_t \uparrow &= (1 - \tau')I_b \uparrow + \tau'\omega'fI_b \uparrow + \tau'\omega'(1 - f)I_t \downarrow + \tau'(1 - \omega')B_c \\ I_b \downarrow &= (1 - \tau')I_t \downarrow + \tau'\omega'fI_t \downarrow + \tau'\omega'(1 - f)I_b \uparrow + \tau'(1 - \omega')B_c\end{aligned}\quad (9)$$

where the total optical depth is  $\tau' = \tau + \tau_g$  and the total single scattering albedo is  $\omega' = \omega\tau/\tau'$ .

The difference between the radiance for cirrus cloud and clear sky cases is

$$\begin{aligned}\Delta I_t \uparrow &= \tau [-(1 - \omega f)I_b \uparrow + \omega(1 - f)I_t \downarrow + (1 - \omega)B_c] \\ \Delta I_b \downarrow &= \tau [-(1 - \omega f)I_t \downarrow + \omega(1 - f)I_b \uparrow + (1 - \omega)B_c]\end{aligned}\quad (10)$$

Thus for an optically thin cloud the procedure of subtracting the clear sky signal from the cloudy signal eliminates the effect of the emission and attenuation by gases in the cloud.

At submm frequencies the single scattering albedo  $\omega$  of the cirrus particles is near unity, except for the smaller sizes. For a cirrus cloud near the tropopause the downwelling clear sky radiance  $I_t \downarrow$  is nearly zero. In this case the radiance difference for upwelling radiation is negative  $\Delta I_t \uparrow \approx -\tau(1 - f)I_b \uparrow$ , so there is a brightness temperature decrease. The radiance difference for downwelling radiation is positive  $\Delta I_b \downarrow \approx \tau(1 - f)I_b \uparrow$ , so there is a brightness temperature increase of the same magnitude. For smaller ice particles where the single scattering albedo  $\omega$  is not as close to 1, the brightness temperature increase for downwelling radiation will be somewhat larger than the upwelling brightness temperature decrease.

The water vapor transmission effect can be understood quantitatively using the first order radiative transfer model. The model (10) is for optically thin (in submm) cirrus with the observer at the cloud boundary. At some distance away from the cloud the intervening water vapor reduces the brightness temperature difference signal according to

$$\Delta I \uparrow_{obs} = T_o(\mu)\Delta I_t \uparrow \quad (11)$$

where  $\Delta I_{obs} \uparrow$  is the radiance difference at the observation point and  $T_o(\mu)$  is the transmission at the viewing angle  $\mu$  between the cloud and the radiometer. Changing the atmospheric profile or cirrus height affects the cirrus Planck function  $B_c$  and the incident radiation  $I_b \uparrow$  and  $I_t \downarrow$ . The effect of the emission of downwelling submm radiation above the cirrus layer can be analyzed by comparing a lower cirrus layer case with the prototype case of the cirrus layer above all the water vapor absorption. The situation is simpler to analyze if the absorption by cirrus is ignored, so  $\omega = 1$ , which is appropriate except for small ice particles. For downward looking geometries the prototype signal is then

$$\text{Tropopause : } \Delta I \uparrow_{proto} = -\tau(1-f)I \uparrow_{clr} \quad (12)$$

where  $I \uparrow_{clr}$  is the clear sky upwelling radiance,  $\tau$  is the submm cirrus optical depth at the viewing angle and  $f$  is the cirrus forward scattering ratio. If the cirrus layer is moved down so that there is water vapor absorption/emission above it, then the downwelling incident radiation has to be considered. This downwelling incident radiation will be backscattered by the cirrus particles causing an increase in radiance and hence reducing the magnitude of the cirrus sensitivity. The upwelling incident radiance will increase slightly, but this can be ignored. The resulting radiance difference signal is

$$\text{Lower : } \Delta I \uparrow_{obs} = T_o(\mu) [-\tau_c(1-f)I \uparrow_{clr} + \tau_c(1-f)I_t \downarrow] \quad (13)$$

It is convenient to express the downwelling incident radiance in terms of the water vapor transmission above the cloud. Because of the greater path length the incident downwelling radiance will be larger for slant paths at large angles. The appropriate incident radiance  $I_t \downarrow$  in terms of the first order radiative transfer model is some average over angles. This may be approximated with a diffusivity factor  $D$ , where  $\bar{\mu} = 1/D$  is a characteristic mean cosine zenith angle. The mean downwelling incident radiance is then

$$I_t \downarrow = (1 - T_a^D) B_a = (1 - e^{-D\tau_a}) B_a \quad (14)$$



where  $\mathcal{T}_a$  is the nadir transmission from space to the cirrus cloud due to water vapor absorption, and  $\tau_a$  is the nadir optical depth. The  $(1 - \mathcal{T}_a^D)$  factor is the above cloud emissivity and  $B_a$  is the Planck function for a mean temperature of the emitting layer above the cloud.

A good way to measure the effect of the water vapor transmission on the sensitivity is to take the ratio of the affected sensitivity to the prototype sensitivity. This ratio of sensitivities is

$$\frac{\Delta I \uparrow_{obs}}{\Delta I \uparrow_{proto}} = \mathcal{T}_o \left[ 1 - \frac{I_t \downarrow}{I \uparrow_{clr}} \right] = \mathcal{T}_o \left[ 1 - (1 - \mathcal{T}_a^D) \frac{B_a}{I \uparrow_{clr}} \right] \quad (15)$$

If the transmission above the cirrus cloud is significantly less than unity then the cirrus cloud is low enough so that the temperature of the emitting layer above the cirrus layer will be approximately the same as the effective radiative temperature of the atmosphere below, so  $B_a \approx I_{clr} \uparrow$ . This results in the approximation that the sensitivity is reduced according to

$$\frac{\Delta I \uparrow_{obs}}{\Delta I \uparrow_{proto}} = \mathcal{T}_o \mathcal{T}_a^D \quad (16)$$

If the observation altitude is above most of the water vapor then the two transmissions are the same for the nadir view and the ratio of the transmission affected sensitivity to the true sensitivity is  $\mathcal{T}_a^{1+D}$ .

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Table 1: The maximum extent  $L$ , rosette bullet diameter  $h$ , column diameter  $h$ , and dipole size  $d$  for the 21 discrete cirrus particle sizes.

Length $L$ ( $\mu\text{m}$ )	Rosette $h$ ( $\mu\text{m}$ )	Column $h$ ( $\mu\text{m}$ )	Dipole size $d$ ( $\mu\text{m}$ )
10	4	6	8
13	4	8	8
16	5	9	8
20	6	11	8
25	8	13	8
32	9	16	8
40	11	19	8
50	13	23	8
63	16	28	8
79	19	33	8
100	23	40	8
126	28	48	8
158	33	58	8
200	40	70	10
251	48	84	13
316	58	100	15
398	69	121	19
501	83	145	23
631	100	175	28
794	121	210	34
1000	145	252	42

Table 2: The 8 particle shapes modeled with the volume fraction given.

Shape	Vol Frac	Description
coln	1.0	solid column
colh	1.0	hollow column (hourglass)
cold	0.65	low density column
rs4o	1.0	4 bullet rosette
rs5o	1.0	5 bullet rosette
rs7o	1.0	7 bullet rosette
stik	0.65	stick-ball
sphr	1.0	sphere

Table 3: Percentiles of fractional difference in radiative sensitivity between observed and gamma particle size distribution fit with moment  $N$  and  $\alpha = 1$ .

Aircraft	Freq (GHz)	$N = 4$		$N = 5$		$N = 6$	
		50%	90%	50%	90%	50%	90%
Sabreliner	340	0.087	0.227	0.031	0.098	0.026	0.077
King Air	340	0.058	0.146	0.044	0.168	0.072	0.210
Sabreliner	630	0.041	0.140	0.043	0.097	0.069	0.149
King Air	630	0.035	0.103	0.055	0.126	0.074	0.154

Table 4: Percentiles of fractional difference in radiative sensitivity between observed and gamma particle size distribution fit with moments  $N1$  and  $N2$ .

Aircraft	Freq (GHz)	$N1 = 4$	$N2 = 6$	$N1 = 2$	$N2 = 6$
		50%	90%	50%	90%
Sabreliner	340	0.000	0.037	0.000	0.077
King Air	340	0.022	0.059	0.051	0.126
Sabreliner	630	0.008	0.051	0.024	0.120
King Air	630	0.008	0.053	0.032	0.076

Table 5: Fit parameters for ice water path as a function of brightness temperature difference ( $IWP = a(\Delta T_b)^b$ ,  $\Delta T_b$  in K and IWP in  $\text{g/m}^2$ ) for six frequencies and three viewing angles/polarizations. The rms error in  $\ln(IWP)$  is also listed. These relations are for FIRE II King Air distributions modeled in a midlatitude summer atmosphere for nadir (downward) viewing.

Freq	View	$a$	$b$	Std Err
150	0	48.65	0.455	0.330
150	49V	48.56	0.531	0.306
150	49H	40.85	0.476	0.332
220	0	25.86	0.446	0.346
220	49V	24.28	0.560	0.307
220	49H	20.39	0.515	0.362
340	0	11.60	0.560	0.382
340	49V	10.57	0.643	0.304
340	49H	8.69	0.585	0.387
500	0	6.13	0.684	0.330
500	49V	5.72	0.692	0.274
500	49H	4.43	0.661	0.347
630	0	3.83	0.794	0.286
630	49V	3.57	0.757	0.250
630	49H	2.63	0.749	0.323
880	0	1.96	0.917	0.225
880	49V	1.64	0.868	0.207
880	49H	1.14	0.894	0.274

Table 6: Range in sensitivity at 500 GHz for two viewing angles (nadir and 49°) and two atmospheres (midlatitude summer-MLS and midlatitude winter-MLW). The range for uncorrected (“UnC”) and corrected (“Cor”) sensitivities is expressed as a ratio. Diffusivity factors are  $D = 1.5$  for 0° view and  $D = 2.0$  for 49° view.

Atmos	0° view		49°V view	
	UnC	Cor	UnC	Cor
MLS	4.07	1.20	7.19	1.25
MLW	5.56	1.16	10.37	1.36



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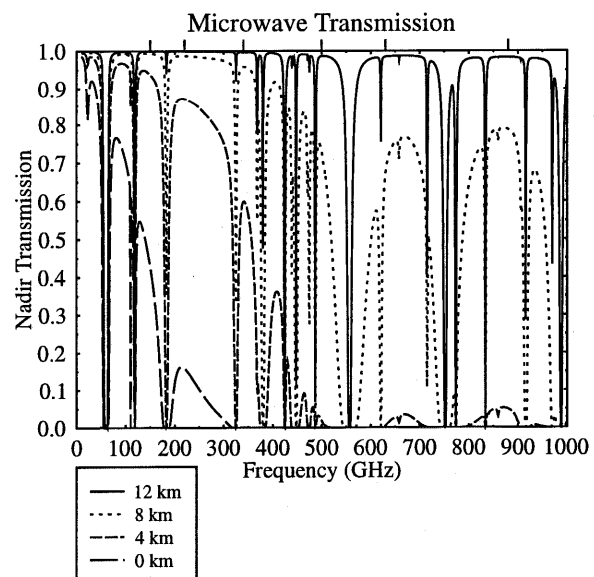


Figure 1: Transmission from space to 12, 8, 4, and 0 km in a standard midlatitude summer atmosphere. The six modeling frequencies (150, 220, 340, 500, 630, 880 GHz) are indicated at the top.

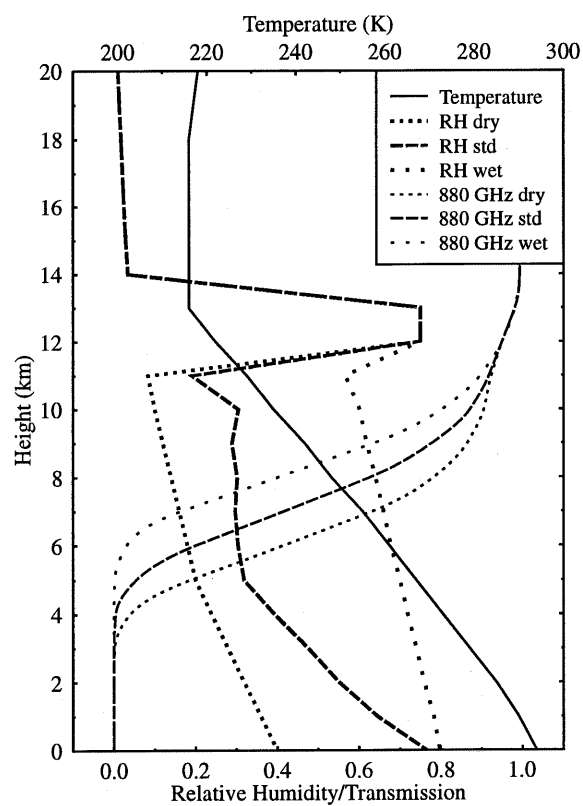


Figure 2: Profiles of temperature, relative humidity, and 880 GHz transmission to space for three summer-time model atmospheres.



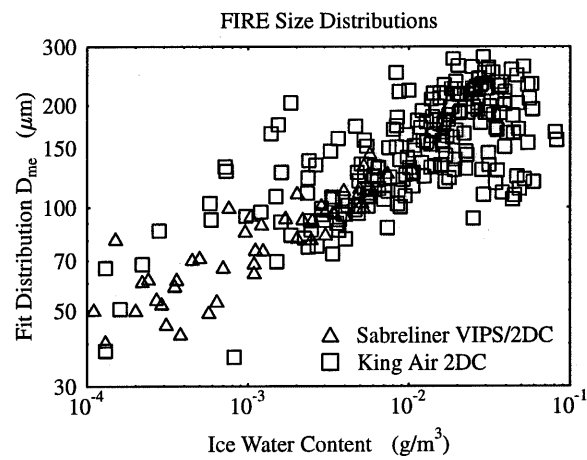


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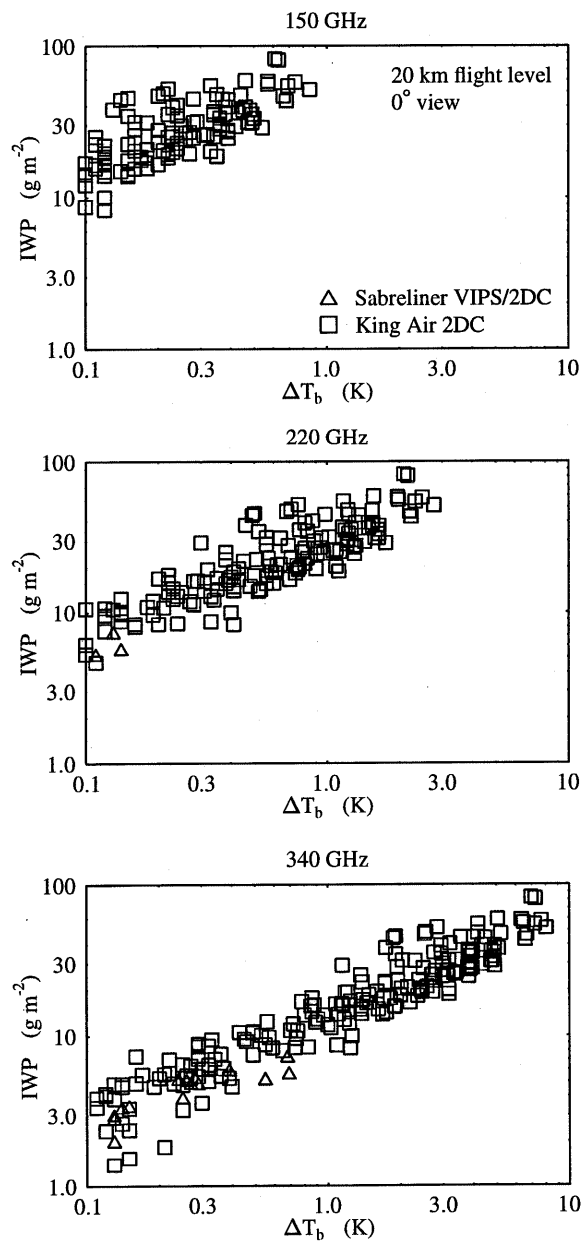


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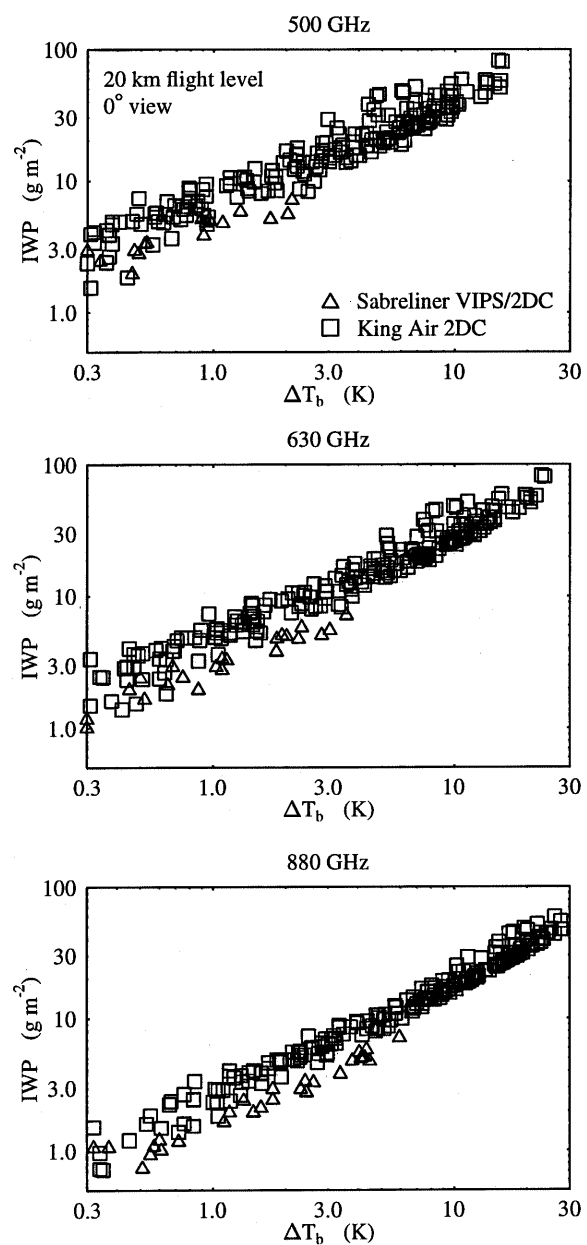


Figure 5: Scatter plots of ice water path (IWP) vs. brightness temperature difference ( $\Delta T_b$ ) for 500, 630, and 880 GHz for ice cloud size distributions measured during FIRE II.

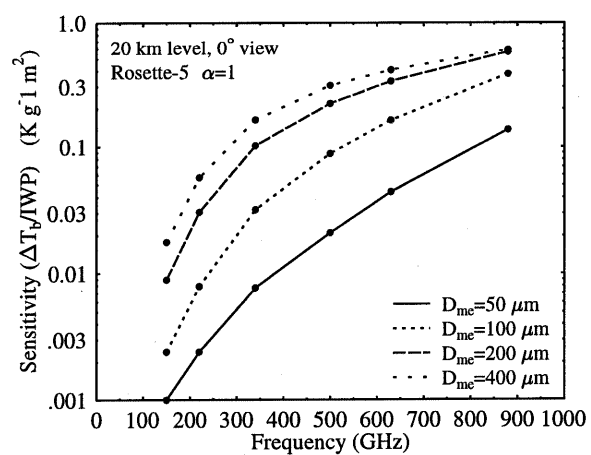


Figure 6: Sensitivity (ratio of  $\Delta T_b$  to ice water path) as a function of frequency for four gamma size distributions of five-bullet rosette crystal shape. A nadir viewing geometry is assumed.

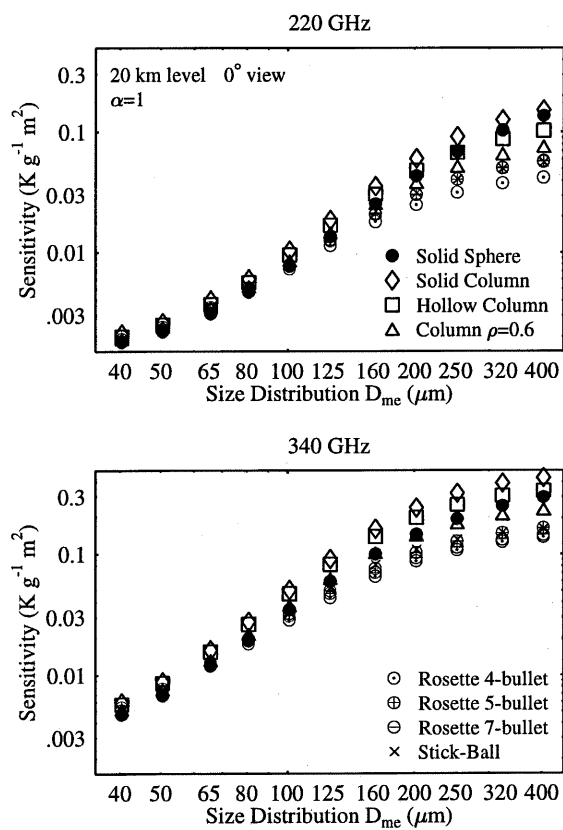


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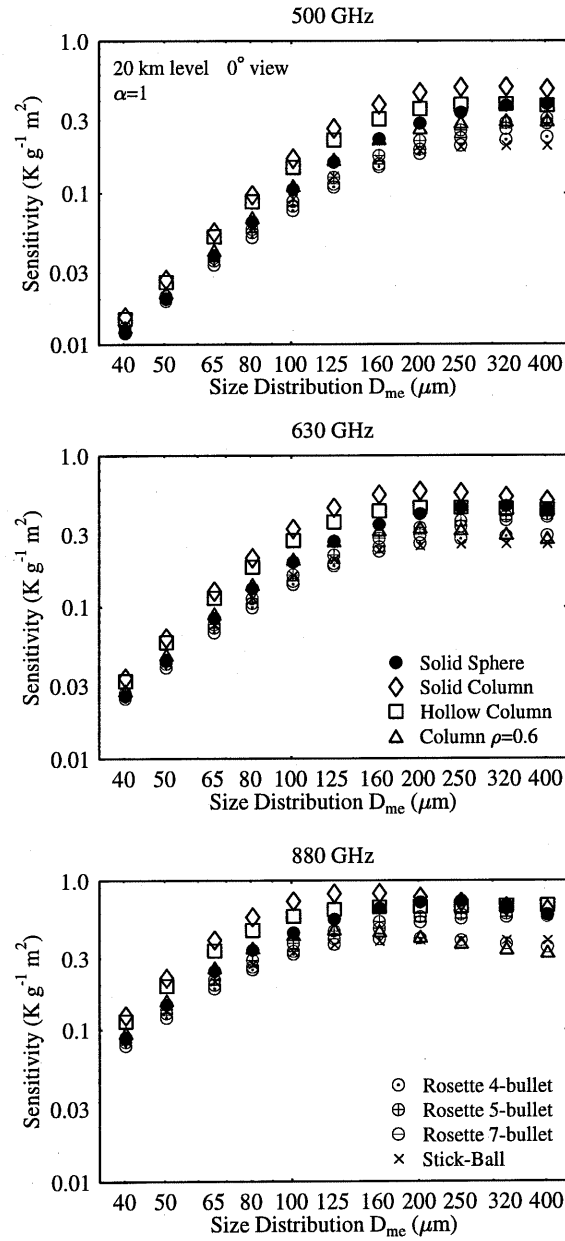


Figure 8: Sensitivity ( $\Delta T_b / IWP$ ) at 500, 630, and 880 GHz for nadir viewing as a function of distribution particle size for eight particle shapes.

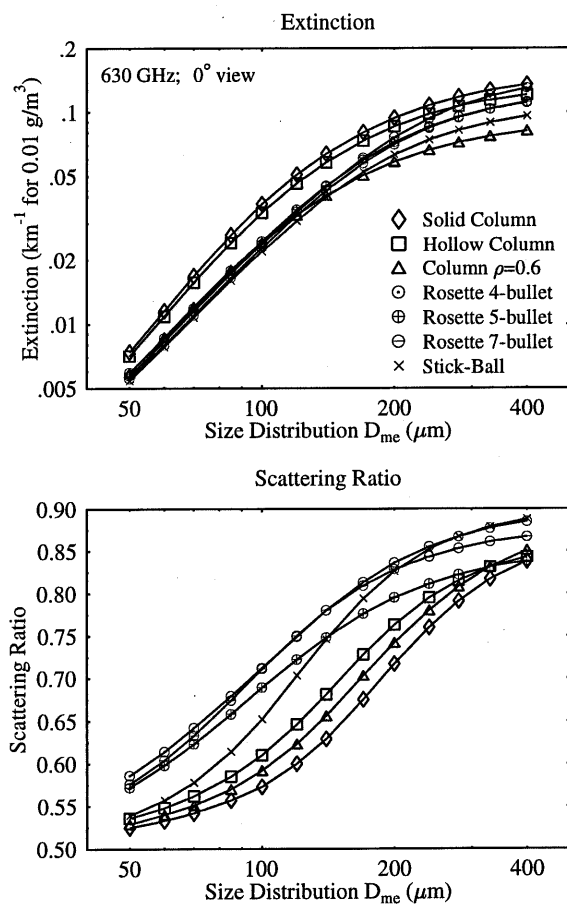


Figure 9: Extinction and forward scattering ratio at 630 GHz for a nadir view angle for seven shapes.

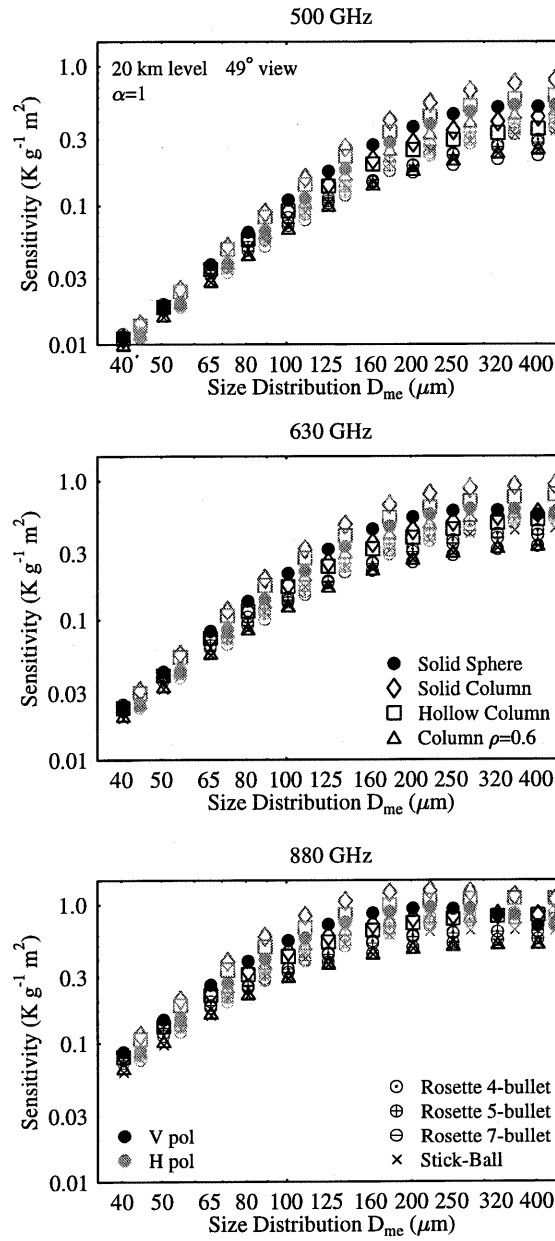


Figure 10: Sensitivity at 500, 630, and 880 GHz for a 49° downward viewing angle as a function of distribution particle size for eight particle shapes. The horizontal polarization sensitivity is in gray and has been offset from the vertical polarization results.



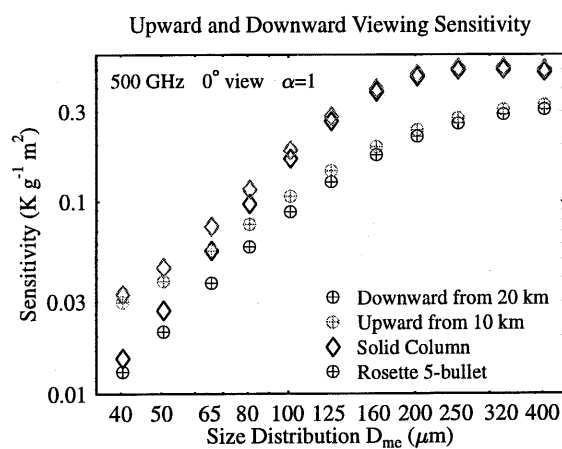


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